

## Using multinomial logistic regression method to investigate the farm-level antimicrobial resistance in *Salmonella* in swine

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### Abstract

The objective of this study was to investigate the farm-level risk factors associated with antimicrobial resistance of *Salmonella* spp. on Ontario swine farms. Fecal samples were collected on 80 swine farms and tested for *Salmonella* and antimicrobial resistance. The farms were classified into three groups including *Salmonella*-negative farms (Group 1), *Salmonella*-positive farms without antimicrobial resistance (Group 2), and *Salmonella*-positive farms with antimicrobial resistance (Group 3). No risk factor was associated with the Group 2 classification. The odds of a farm being in Group 3 was 8.4 times higher if pelleted feed was used compared to mash feed ( $P = 0.02$ ). Farms that were grower-finisher operations compared to farrow to finisher operation were 5.2 times more likely to be in Group 3 ( $P = 0.007$ ). The larger farms were more likely to be in Group 3 ( $P = 0.035$ ). There was no evidence of interaction at the level of  $P < 0.05$ . These findings indicate that the multinomial regression approach is of importance for investigating the risk factors and taking the appropriate approach to each group of farms if a control program were to be implemented or an intervention applied.

### Introduction

*Salmonella* spp continue to be important foodborne pathogens (Mead et al., 1999), particularly serovars demonstrating multiple antimicrobial resistance (Threlfal et al., 2003). Pork products contaminated with *Salmonella* are an important source of *Salmonella* infection in humans. Multidrug resistant *Salmonella* serovars are associated with increased hospitalization, mortality and consequent economic cost (Travers et al., 2002) and these serovars are emerging as a concern for the global pork industry. Therefore, epidemiological studies need to be conducted in order to gain a better understanding of risk factors for antimicrobial resistance. The objective of this study was to investigate the farm-level risk factors associated with antimicrobial resistance of *Salmonella* spp. on Ontario swine farms.

### Materials and methods

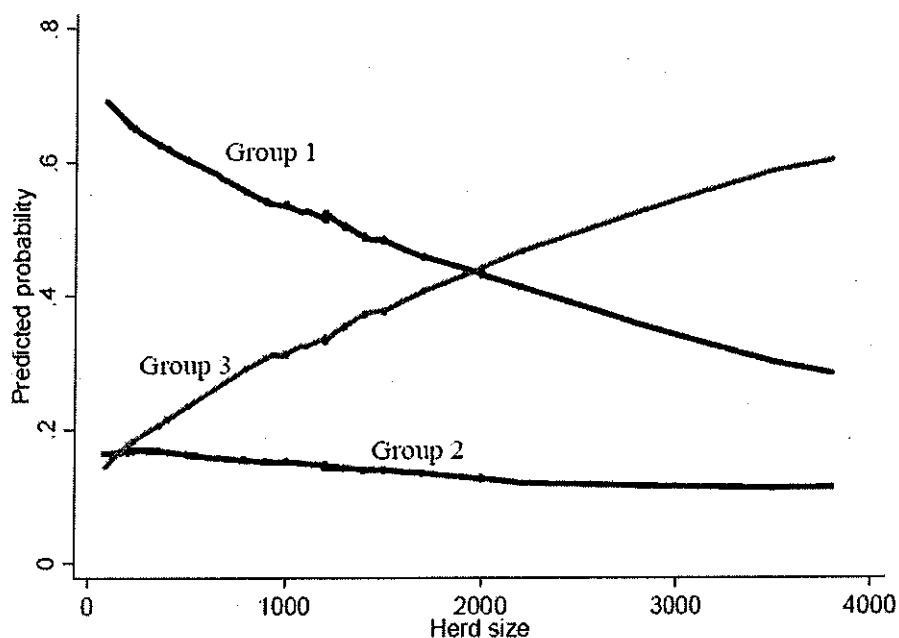
Fecal samples were collected on 80 swine farms and cultured for *Salmonella* (D'Aoust, 1998) and the isolates were tested for antimicrobial resistance (CLSI, 2004 and 2005). Information regarding pig flow, in-feed and water antimicrobial usage, herd size, type of operation, and feed form were collected. A multinomial logistic regression modeling method was used to investigate the risk factors associated with both *Salmonella*-positive farms with antimicrobial resistance and those risk factors associated with *Salmonella*-positive farms without antimicrobial resistance (Dohoo et al., 2003) {Dohoo, Wayne, et al. 2003 #2060}.

### Results

The eighty farms were classified into three groups including 43 *Salmonella*-negative farms (Group 1), 12 *Salmonella*-positive farms with no antimicrobial resistance (Group 2), and 25 *Salmonella*-positive farms

with antimicrobial resistance (Group 3). In multinomial logistic regression modeling, the association between the risk factors and outcome in Group 2 and Group 3 were compared with Group 1 as the base outcome. No risk factor was associated with the Group 2 classification. The odds of a farm being in Group 3 was 8.4 (95% CI 1.4, 49.8) times higher if pelleted feed was used compared to mash feed ( $P = 0.02$ ). Farms that were grower-finisher operations compared to farrow to finisher operation were more likely to be in Group 3 ( $P = 0.007$ ). The shape of relationship between herd size and predicted probability of being in the three groups is shown in Figure. The larger farms were more likely to be in Group 3 ( $P = 0.035$ ).

**Figure 1: The relationship between herd size and probability of being in one of three groups\* of swine farms**



\* Group 1: *Salmonella*-negative; Group 2: *Salmonella*-positive without AMR; Group 3: *Salmonella*-positive with AMR

## Discussion

The objective of this study was to investigate the associated risk factors for antimicrobial resistance in *Salmonella*. In-feed and water antimicrobial usage was not associated with *Salmonella* shedding either susceptible (Group 2) or resistant (Group 2) isolates on swine farms. However, the data on drug use in this study was collected prior to the fecal collection and the drug use policy may have changed on certain farms. Commingling pigs from different sources is more likely on grower-finisher operations than on farrow-finisher farms and this may explain the higher risk of resistant *Salmonella* on the grow-finisher farms. Pelleted feed has been reported before as a common risk factor for increasing *Salmonella* occurrence in swine (Lo Fo Wong et al., 2004; Kranker et al., 2001; von Altrock et al., 2000). However, in the current study, pelleted feed did not appear to be a risk factor for farms testing positive for *Salmonella* with no AMR (Group 2) although it had a significant effect on increasing the probability of classifying a farm as multidrug resistant *Salmonella* group (Group 3). Since antimicrobial resistance was associated with serovar, the impact of feed related factors on occurrence of *Salmonella* might be serovar-dependent. This possibility warrants further studies. The current study is the first study on risk factors for *Salmonella* in pigs using multinomial regression analyzing in that the outcome has been refined into three different

categories. This is of importance for investigating the risk factors and taking the appropriate approach to each group of farms if a control program were to be implemented or an intervention applied.

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differences in sampling strategy and culture methods. Yet, it indicates that the antimicrobial resistance in swine is dynamic and that monitoring over time may be useful to detect changes in antimicrobial resistance patterns on swine farms. Among the three groups of farms which defined in the current study, the Group 3 is of particular concern from a public health standpoint and pig production and warrants attention. Further studies need to be conducted to compare the risk factors that distinguish these three groups of farms.

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